# zmPDSwR Chapter 3 Part I

coop711 2015년 9월 12일

### Data

### 자료 읽어들이기

setwd("~/Dropbox/Works/Class/Data\_Science/R.WD/zmPDSwR/")
custdata <- read.table("../../zmPDSwR/Custdata/custdata.tsv", header=TRUE, se
p="\t", stringsAsFactors=TRUE)</pre>

### 기초 통계

• Missing values는 어디에 많이 등장하는가? 그 이유는 무엇이라고 생각되는가?

summary(custdata)

```
##
       custid
                    sex
                           is.employed
                                              income
   Min. : 2068 F:440
                                          Min. : -8700
##
                           Mode :logical
   1st Qu.: 345667 M:560
##
                           FALSE:73
                                          1st Qu.: 14600
   Median : 693403
                           TRUE :599
                                          Median : 35000
##
##
   Mean : 698500
                           NA's :328
                                          Mean : 53505
##
   3rd Qu.:1044606
                                          3rd Qu.: 67000
##
   Max. :1414286
                                          Max. :615000
##
##
              marital.stat health.ins
##
   Divorced/Separated:155
                         Mode :logical
                   :516 FALSE:159
##
   Married
   Never Married
##
                   :233 TRUE :841
##
   Widowed
                    : 96 NA's :0
##
##
##
##
                        housing.type recent.move
                                                   num.vehicles
##
   Homeowner free and clear
                             :157 Mode :logical Min. :0.000
   Homeowner with mortgage/loan:412 FALSE:820
##
                                                   1st Qu.:1.000
##
   Occupied with no rent
                             : 11 TRUE :124
                                                   Median :2.000
                             :364
##
   Rented
                                    NA's :56
                                                   Mean :1.916
   NA's
                             : 56
##
                                                   3rd Qu.:2.000
##
                                                   Max. :6.000
                                                   NA's :56
##
##
                       state.of.res
       age
##
  Min. : 0.0 California :100
   1st Qu.: 38.0 New York
##
                            : 71
##
   Median: 50.0
                  Pennsylvania: 70
   Mean : 51.7
##
                  Texas
                            : 56
   3rd Qu.: 64.0
##
                  Michigan
                             : 52
##
   Max. :146.7
                  Ohio
                             : 51
##
                  (Other)
                             :600
```

• 타당치 않은 값들을 찾아본다면?

```
summary(custdata$income)
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## -8700 14600 35000 53500 67000 615000
```

```
summary(custdata$age)
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.0 38.0 50.0 51.7 64.0 146.7
```

### 자료 구조

• factor 의 class, mode, typeof 가 각각 어떻게 나타나는지 유의

str(custdata)

```
1000 obs. of 11 variables:
## 'data.frame':
## $ custid : int 2068 2073 2848 5641 6369 8322 8521 12195 14989 15917
. . .
##
   $ sex
                 : Factor w/ 2 levels "F", "M": 1 1 2 2 1 1 2 2 2 1 ...
   $ is.employed : logi NA NA TRUE TRUE TRUE TRUE ...
##
                 : int 11300 0 4500 20000 12000 180000 120000 40000 9400 2400
## $ income
0 ...
## $ marital.stat: Factor w/ 4 levels "Divorced/Separated",..: 2 2 3 3 3 3 2
2 1 ...
## $ health.ins : logi TRUE TRUE FALSE FALSE TRUE TRUE ...
## $ housing.type: Factor w/ 4 levels "Homeowner free and clear",..: 1 4 4 3 4
2 1 4 4 1 ...
##
   $ recent.move : logi FALSE TRUE TRUE FALSE TRUE FALSE ...
## $ num.vehicles: int 2 3 3 0 1 1 1 3 2 1 ...
                 : num 49 40 22 22 31 40 39 48 44 70 ...
##
   $ age
## $ state.of.res: Factor w/ 50 levels "Alabama", "Alaska",..: 22 9 10 31 9 32
12 22 13 33 ...
```

#### sapply(custdata, class)

```
##
         custid
                         sex is.employed
                                                 income marital.stat
                               "logical"
##
      "integer"
                    "factor"
                                              "integer"
                                                            "factor"
##
     health.ins housing.type recent.move num.vehicles
                                                                 age
                    "factor"
                                "logical"
##
      "logical"
                                              "integer"
                                                           "numeric"
## state.of.res
##
       "factor"
```

#### sapply(custdata, mode)

```
##
        custid
                        sex is.employed
                                               income marital.stat
##
      "numeric"
                               "logical"
                  "numeric"
                                            "numeric"
                                                         "numeric"
##
    health.ins housing.type recent.move num.vehicles
                                                               age
##
      "logical"
                  "numeric"
                              "logical"
                                            "numeric"
                                                         "numeric"
## state.of.res
##
      "numeric"
```

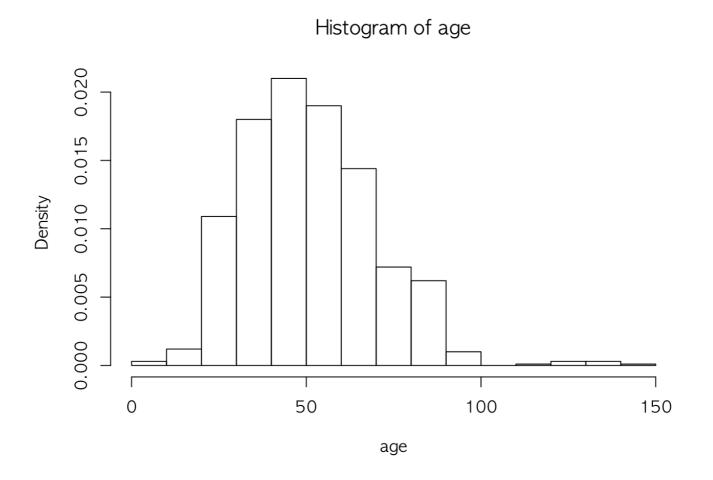
#### sapply(custdata, typeof)

```
##
         custid
                         sex is.employed
                                                income marital.stat
##
      "integer"
                   "integer"
                               "logical"
                                             "integer"
                                                           "integer"
##
     health.ins housing.type recent.move num.vehicles
                                                                 age
##
      "logical"
                   "integer"
                                "logical"
                                             "integer"
                                                            "double"
## state.of.res
##
      "integer"
```

## Visualization

• with 를 쓰지 않고 hist(custdata\$age, prob=TRUE) 로 하면 어느 요소가 어떻게 달라지는가?

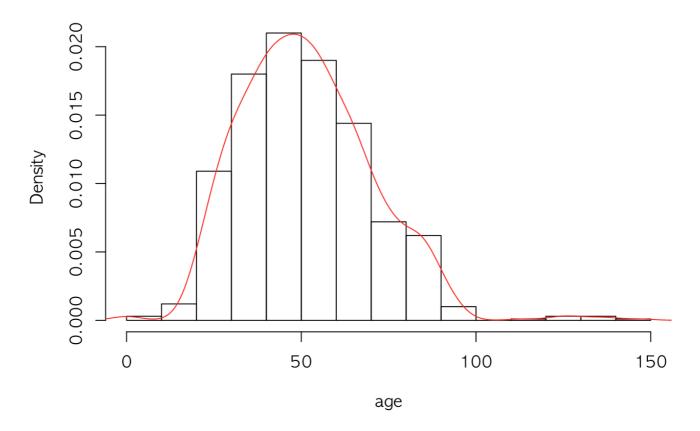
```
with(custdata, hist(age, prob=TRUE))
```



• density estimation 을 추가

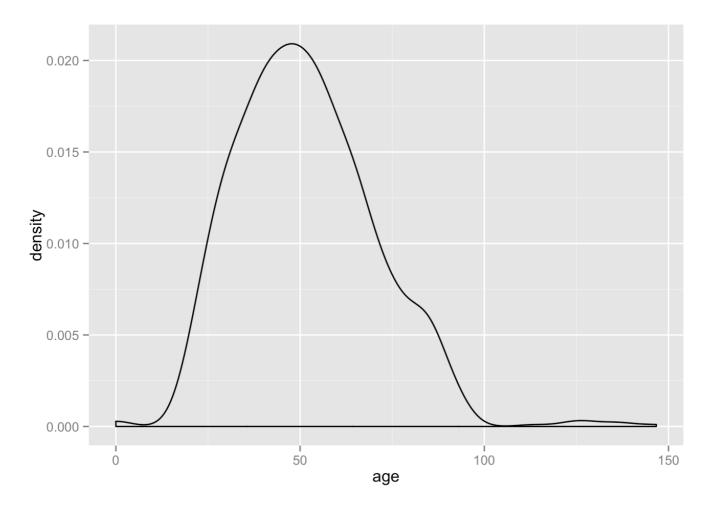
```
with(custdata, hist(age, prob=TRUE))
with(custdata, lines(density(age), col="red"))
```

### Histogram of age



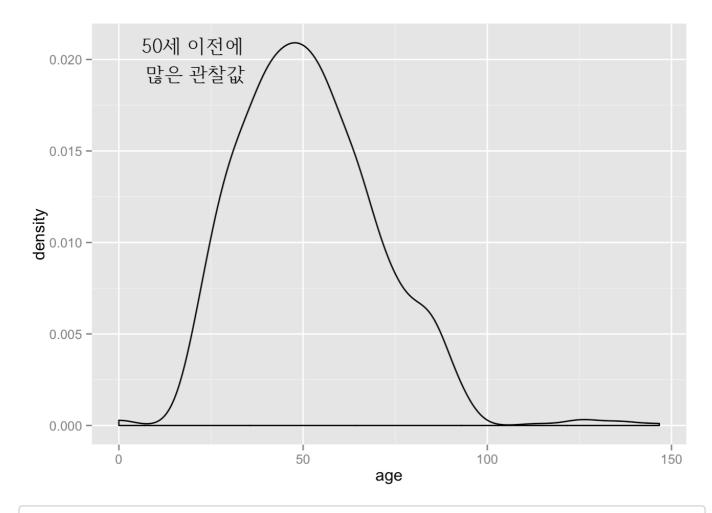
• ggplot 으로 표현하면,

```
library(ggplot2)
(g1 <- ggplot(custdata, aes(x=age)) + geom_density())</pre>
```

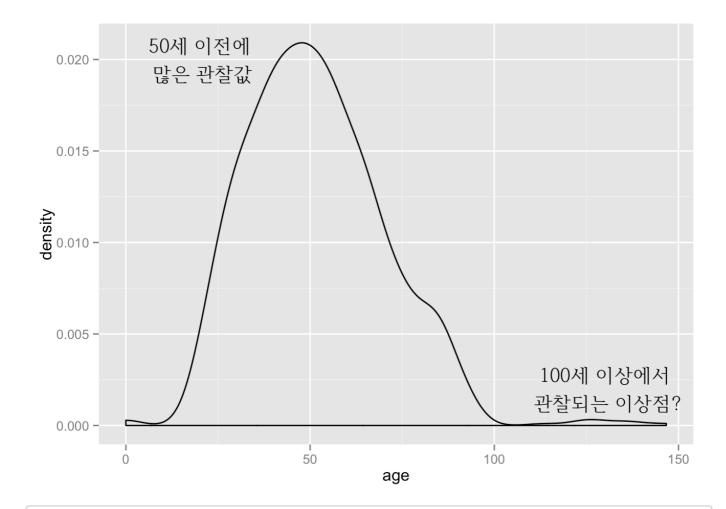


• 도표 안에 텍스트를 추가하려면, annotate() 사용

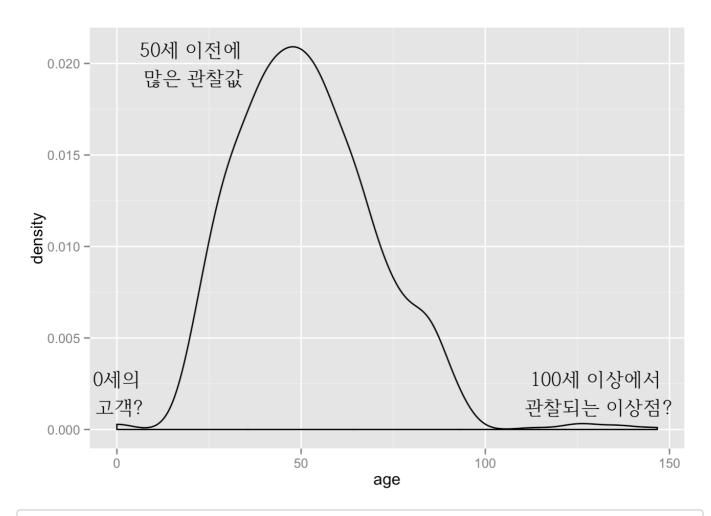
 $(g2 <- g1 + annotate("text", x=20, y=0.02, label="50세 이전에\n 많은 관찰값", famil y="HCR Batang LVT"))$ 



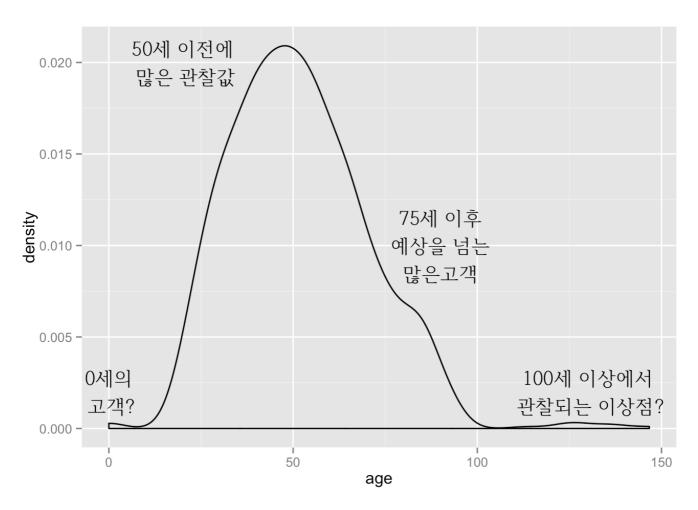
(g3 <- g2 + annotate("text", x=130, y=0.002, label="100세 이상에서\n 관찰되는 이상 점?", family="HCR Batang LVT"))



 $(g4 \leftarrow g3 + annotate("text", x=0, y=0.002, label="0세의 n 고객?", family="HCR Batang LVT"))$ 

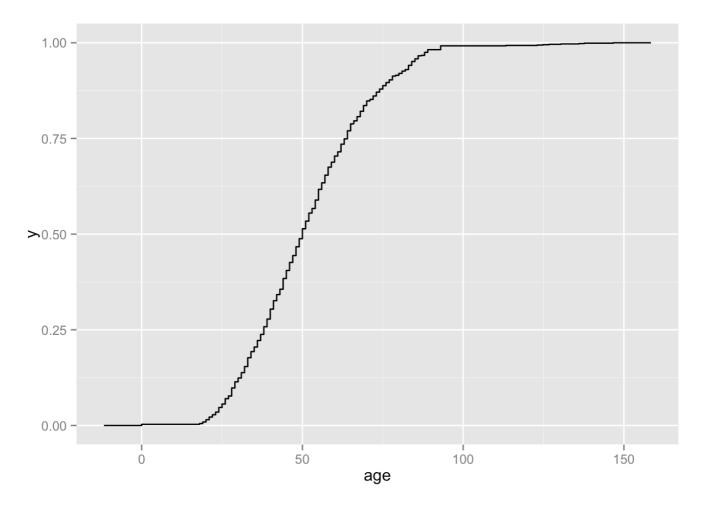


 $(g5 <- g4 + annotate("text", x=90, y=0.01, label="75세 이후 \n예상을 넘는 \n많은고객", family="HCR Batang LVT"))$ 



• 기초통계를 파악하는 데는 summary() 가 낫다는 기술에 대해서. 적어도 분위수에 관한 한 ecdf 가 시각적으로 우수함.

```
(g.ecdf <- ggplot(custdata, aes(x=age)) + stat_ecdf())
```

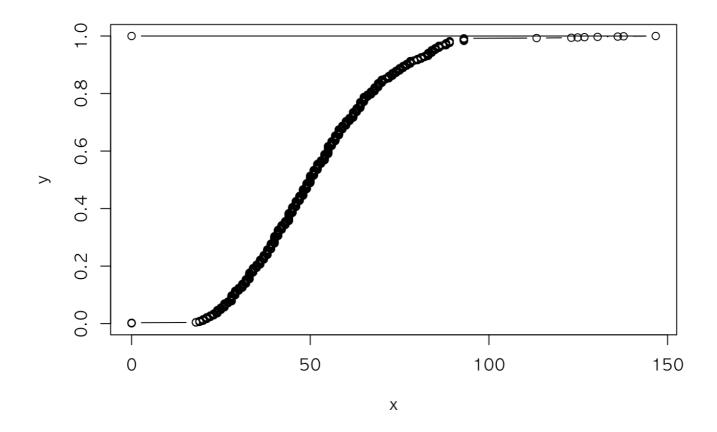


• 게다가 도표 윗 부분은 바로 평균이라는 점을 기억해 두어야 할 것임. 좀 복잡해 보이지만, geom\_polygon()을 이용하기 위해서는 다각형을 나타내는 좌표를 data frame으로 갖춰야 함.

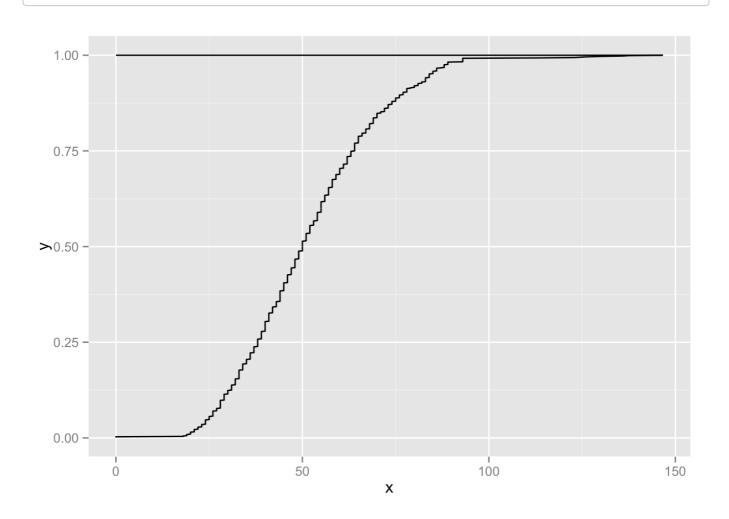
```
poly.x <- c(sort(custdata$age), sort(custdata$age)[1])
poly.y <- c((1:length(custdata$age))/length(custdata$age), 1)
poly.age <- data.frame(x=poly.x, y=poly.y)</pre>
```

• 제대로 갖추었는지 확인

```
plot(y ~ x, data=poly.age, type="b")
```

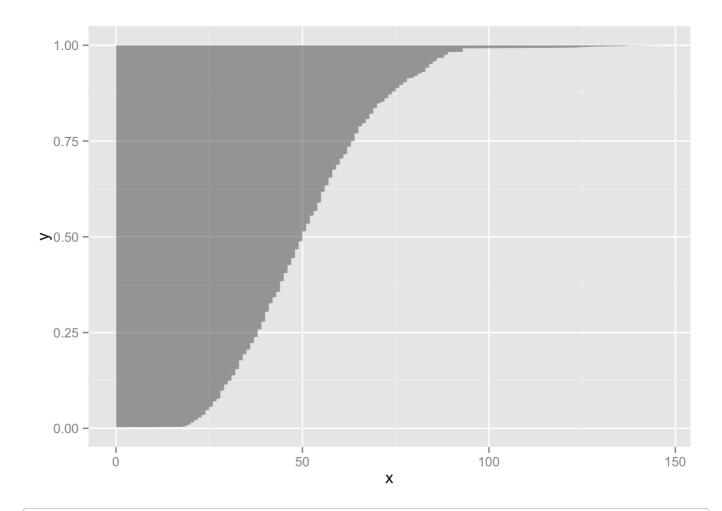


### ggplot(poly.age, aes(x=x, y=y)) + geom\_path()

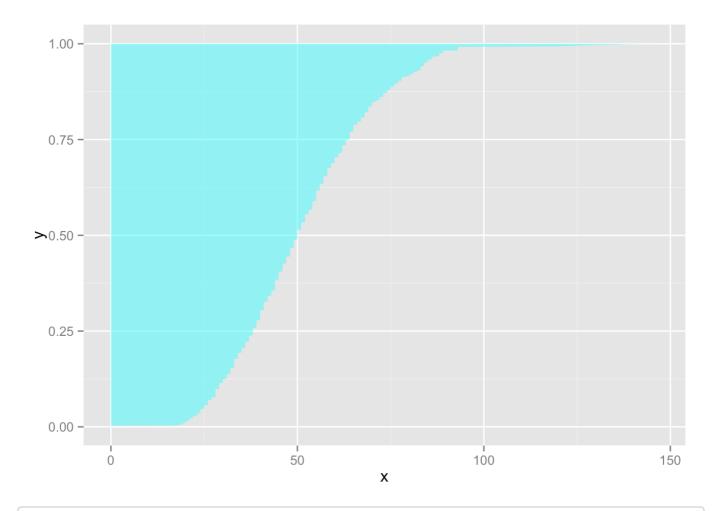


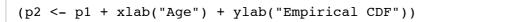
• geom\_polygon() 에 alpha 로 조정. 색은 fill 로 설정.

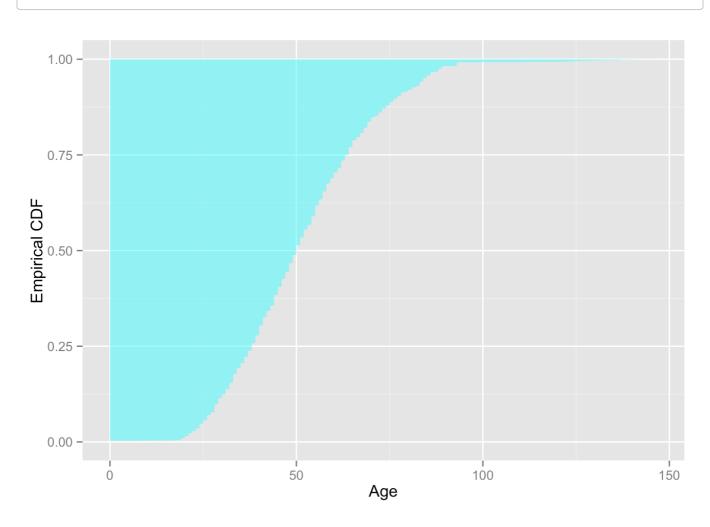
```
(p <- ggplot(poly.age, aes(x=x, y=y)) + geom_polygon(alpha=0.5))</pre>
```



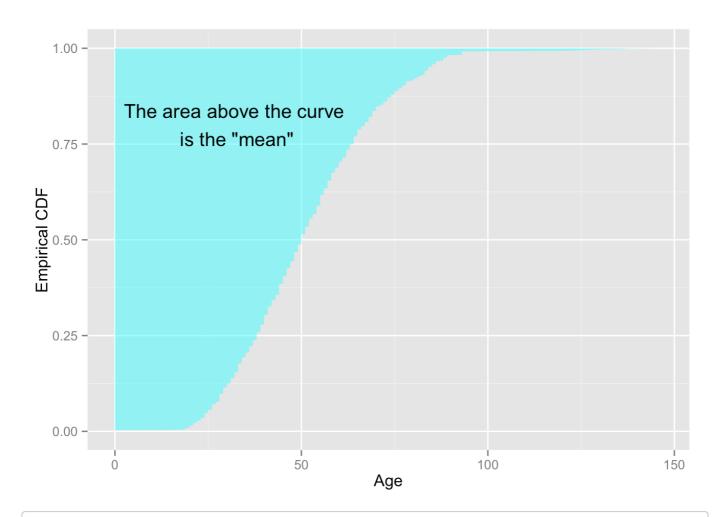
 $(p1 \leftarrow ggplot(poly.age, aes(x=x, y=y)) + geom_polygon(fill="cyan", alpha=0.5))$ 



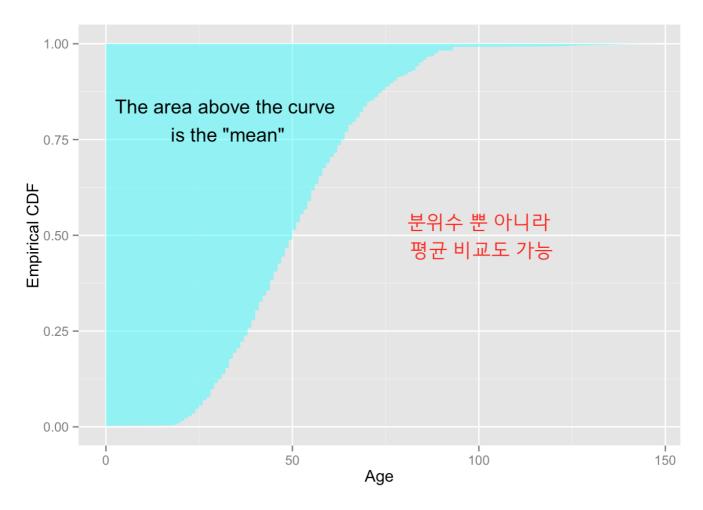




(p3 <- p2 + annotate("text", x=32, y=0.8, label="The area above the curve\n is the \"mean\""))

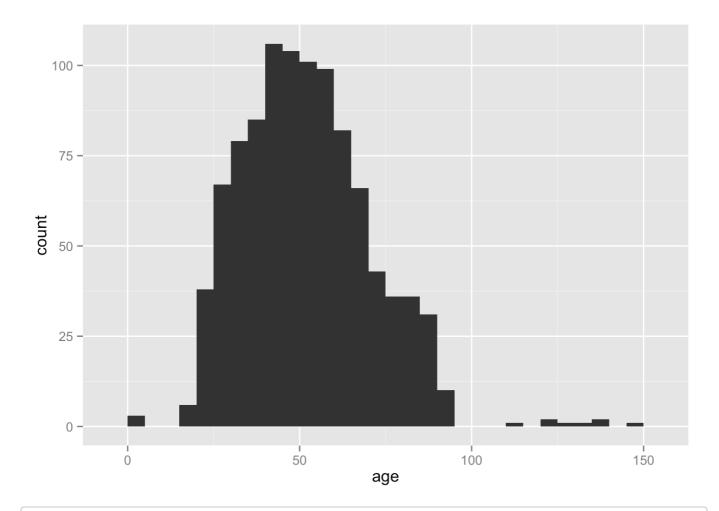


 $(p4 <- p3 + annotate("text", x=100, y=0.5, label="분위수 뿐 아니라\n 평균 비교도 가능", family="HCR Dotum LVT", colour="red"))$ 

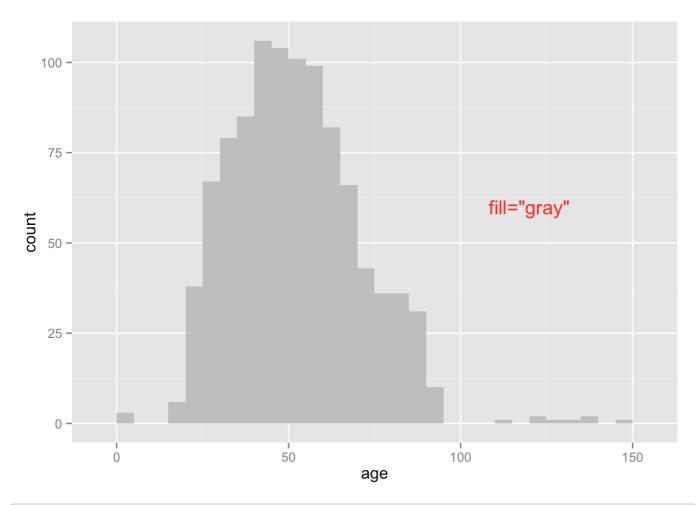


• 히스토그램으로 요약하기. 각각의 차이가 어디서 비롯되는지 이해할 것.

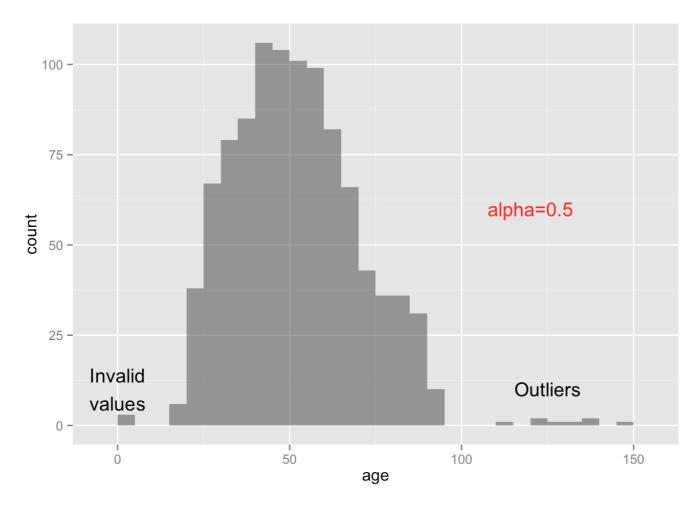
```
ggplot(custdata, aes(x=age)) + geom_histogram(binwidth=5)
```



ggplot(custdata, aes(x=age)) + geom\_histogram(binwidth=5, fill="gray") +
annotate("text", x=120, y=60, label="fill=\"gray\"", colour="red")



```
ggplot(custdata, aes(x=age)) + geom_histogram(binwidth=5, alpha=0.5) +
annotate("text", x=120, y=60, label="alpha=0.5", colour="red") +
annotate("text", x=125, y=10, label="Outliers") +
annotate("text", x=0, y=10, label="Invalid\nvalues")
```



#### · Density Plots

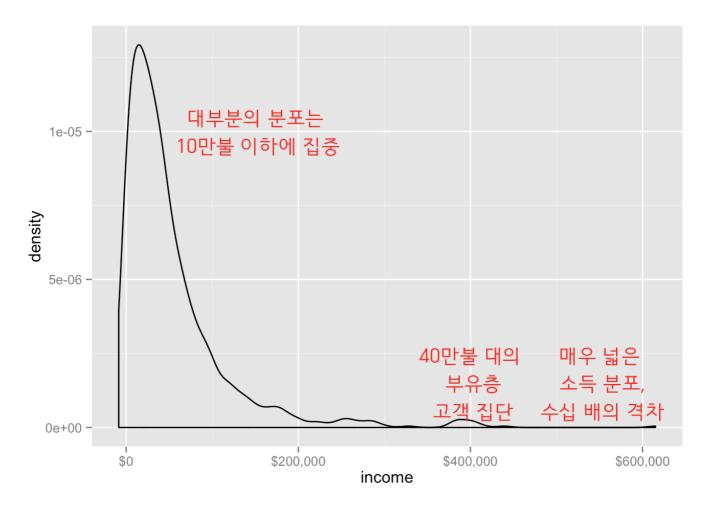
```
library(scales)

ggplot(custdata) + geom_density(aes(x=income)) +
    scale_x_continuous(labels=dollar) +
    annotate("text", x=150000, y=0.00001, label="대부분의 분포는\n 10만불 이하에 집중", f

amily="HCR Dotum LVT", colour="red") +
    annotate("text", x=400000, y=0.0000015, label="40만불 대의\n 부유층\n 고객 집단", f

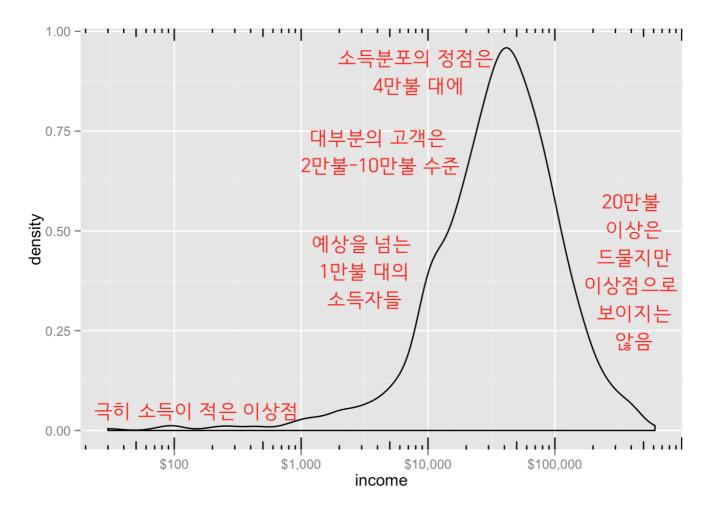
amily="HCR Dotum LVT", colour="red") +
    annotate("text", x=550000, y=0.0000015, label="매우 넓은\n 소득 분포,\n 수십 배의 격

차", family="HCR Dotum LVT", colour="red")
```



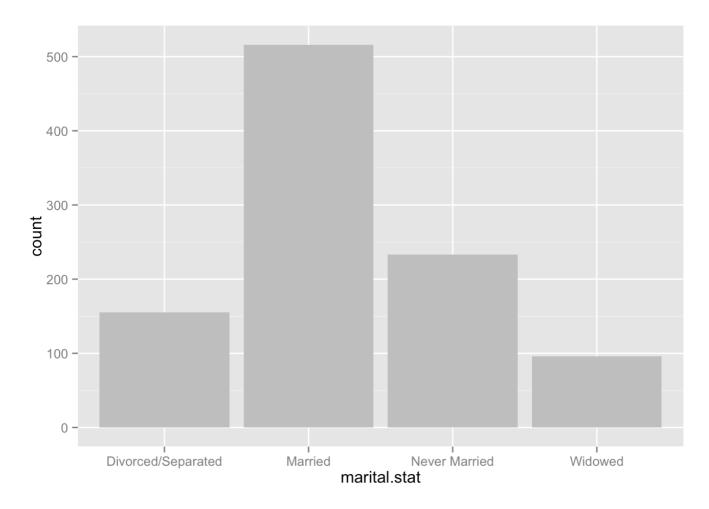
• Density plots on log-scale. 왜 warning=FALSE 를 켜 놓았는지 확인해 볼 것.

```
ggplot(custdata) + geom_density(aes(x=income)) +
scale_x_log10(breaks=c(100, 1000, 100000, 100000), labels=dollar) +
annotation_logticks(side="bt") +
annotate("text", x=150, y=0.05, label="극히 소득이 적은 이상점", family="HCR Dotum
LVT", colour="red") +
annotate("text", x=3000, y=0.4, label="예상을 넘는\n 1만불 대의\n 소득자들", famil
y="HCR Dotum LVT", colour="red") +
annotate("text", x=4000, y=0.7, label="대부분의 고객은\n 2만불-10만불 수준", famil
y="HCR Dotum LVT", colour="red") +
annotate("text", x=8000, y=0.9, label="소득분포의 정점은\n 4만불 대에", family="HCR
Dotum LVT", colour="red") +
annotate("text", x=400000, y=0.4, label="20만불\n 이상은\n 드물지만\n이상점으로\n 보이
지는\n 않음", family="HCR Dotum LVT", colour="red")
```



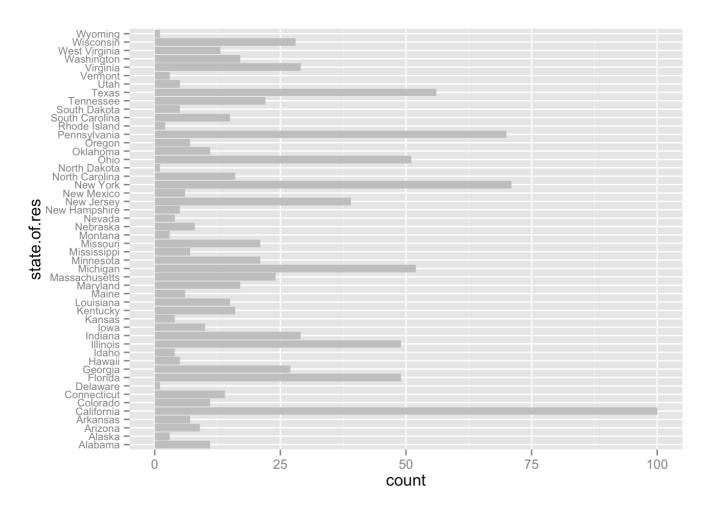
#### Bar Charts

```
ggplot(custdata, aes(x=marital.stat)) + geom bar(fill="gray")
```



• Bar Charts for state.of.res

```
ggplot(custdata, aes(x=state.of.res)) + geom_bar(fill="gray") +
  coord_flip() +
  theme(axis.text.y=element_text(size=rel(0.8)))
```



• 등록된 거주자 수효대로 각 주를 정렬시키려면, reorder() 가 필요함. 교재의 방법을 따르면 다음과 같이 할수 있음.

(sor.tbl <- table(custdata\$state.of.res))</pre>

					##
California	Arkansas	Arizona	Alaska	Alabama	##
100	7	9	3	11	##
Georgia	Florida	Delaware	Connecticut	Colorado	##
27	49	1	14	11	##
Iowa	Indiana	Illinois	Idaho	Hawaii	##
10	29	49	4	5	##
Maryland	Maine	Louisiana	Kentucky	Kansas	##
17	6	15	16	4	##
Missouri	Mississippi	Minnesota	Michigan	Massachusetts	##
21	7	21	52	24	##
New Jersey	New Hampshire	Nevada	Nebraska	Montana	##
39	5	4	8	3	##
Ohic	North Dakota	North Carolina	New York	New Mexico	##
51	1	16	71	6	##
South Carolina	Rhode Island	Pennsylvania	Oregon	Oklahoma	##
15	2	70	7	11	##
Vermont	Utah	Texas	Tennessee	South Dakota	##
3	5	56	22	5	##
Wyoming	Wisconsin	West Virginia	Washington	Virginia	##
1	28	13	17	29	##

(sor.df <- data.frame(sor.tbl))</pre>

```
##
                 Varl Freq
## 1
             Alabama
                        11
## 2
                          3
               Alaska
## 3
             Arizona
                          9
## 4
            Arkansas
                         7
## 5
          California
                      100
## 6
            Colorado
                        11
## 7
         Connecticut
                        14
## 8
            Delaware
                        1
## 9
             Florida
                        49
## 10
             Georgia
                        27
## 11
               Hawaii
                         5
## 12
                        4
                Idaho
## 13
            Illinois
                        49
## 14
             Indiana
                        29
## 15
                 Iowa
                        10
## 16
                         4
               Kansas
## 17
            Kentucky
                        16
## 18
           Louisiana
                        15
## 19
                Maine
                        6
## 20
            Maryland
                        17
## 21
      Massachusetts
                        24
## 22
            Michigan
                        52
## 23
           Minnesota
                        21
## 24
         Mississippi
                        7
## 25
            Missouri
                        21
## 26
                         3
             Montana
## 27
            Nebraska
                         8
## 28
                         4
               Nevada
## 29
       New Hampshire
                         5
## 30
          New Jersey
                        39
## 31
          New Mexico
                        6
## 32
            New York
                        71
## 33 North Carolina
                        16
## 34
        North Dakota
                        1
## 35
                 Ohio
                        51
## 36
            Oklahoma
                        11
                         7
## 37
               Oregon
## 38
        Pennsylvania
                        70
## 39
        Rhode Island
                         2
## 40 South Carolina
                        15
## 41
        South Dakota
                        5
## 42
           Tennessee
                        22
## 43
                Texas
                        56
                         5
## 44
                 Utah
## 45
             Vermont
                         3
            Virginia
## 46
                        29
## 47
          Washington
                        17
## 48
       West Virginia
                        13
## 49
           Wisconsin
                        28
## 50
              Wyoming
                         1
```

```
str(sor.df)
## 'data.frame':
                  50 obs. of 2 variables:
## $ state.of.res: Factor w/ 50 levels "Alabama", "Alaska",..: 1 2 3 4 5 6 7 8
9 10 ...
## $ count : int 11 3 9 7 100 11 14 1 49 27 ...
str(reorder(sor.df$state.of.res, sor.df$count))
## Factor w/ 50 levels "Delaware", "North Dakota",..: 23 5 21 17 50 24 27 1 43
38 ...
## - attr(*, "scores") = num [1:50(1d)] 11 3 9 7 100 11 14 1 49 27 ...
    ..- attr(*, "dimnames")=List of 1
##
##
    ....$ : chr [1:50] "Alabama" "Alaska" "Arizona" "Arkansas" ...
sor.df.o <- transform(sor.df, state.of.res=reorder(state.of.res, count))</pre>
str(sor.df.o)
## 'data.frame':
                   50 obs. of 2 variables:
## $ state.of.res: Factor w/ 50 levels "Delaware", "North Dakota",..: 23 5 21 1
7 50 24 27 1 43 38 ...
##
    ..- attr(*, "scores")= num [1:50(1d)] 11 3 9 7 100 11 14 1 49 27 ...
     ... - attr(*, "dimnames")=List of 1
##
    ....$ : chr "Alabama" "Alaska" "Arizona" "Arkansas" ...
##
                 : int 11 3 9 7 100 11 14 1 49 27 ...
## $ count
```

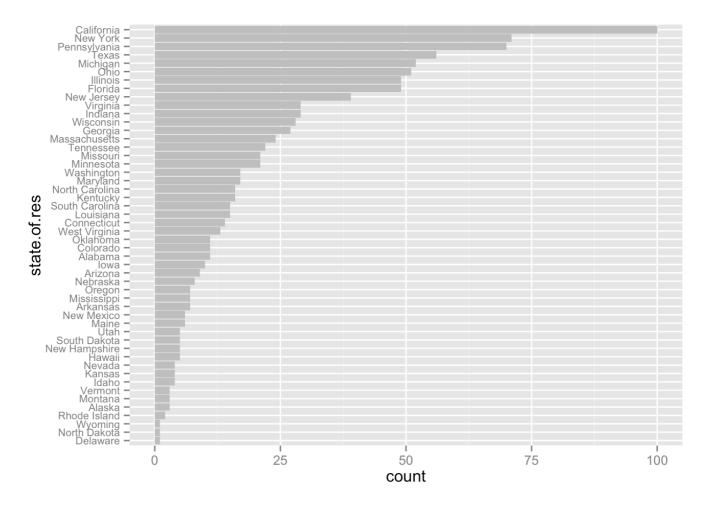
ggplot(sor.df.o, aes(x=state.of.res, y=count)) + geom\_bar(stat="identity", fil

theme(axis.text.y=element\_text(size=rel(0.8)))

colnames(sor.df) <- c("state.of.res", "count")</pre>

l="gray") +

coord flip() +



• 굳이 transform() 까지 사용하지 않더라도, sor.df 만 가지고도 원하는 작업은 할 수 있음.

(sor.df.2 <- data.frame(sor.tbl))</pre>

```
##
                 Var1 Freq
## 1
             Alabama
## 2
               Alaska
                          3
## 3
             Arizona
                          9
## 4
            Arkansas
                         7
## 5
          California
                      100
## 6
            Colorado
                        11
## 7
         Connecticut
                        14
## 8
            Delaware
                        1
## 9
             Florida
                        49
## 10
             Georgia
                        27
## 11
              Hawaii
                         5
## 12
                Idaho
                        4
## 13
            Illinois
                        49
## 14
             Indiana
                        29
## 15
                 Iowa
                        10
## 16
                         4
               Kansas
## 17
            Kentucky
                        16
## 18
           Louisiana
                        15
## 19
                Maine
                        6
## 20
            Maryland
                        17
## 21
      Massachusetts
                        24
## 22
            Michigan
                        52
## 23
           Minnesota
                        21
## 24
         Mississippi
                         7
## 25
            Missouri
                        21
## 26
             Montana
                         3
## 27
            Nebraska
                         8
## 28
                         4
               Nevada
## 29
       New Hampshire
                         5
## 30
          New Jersey
                        39
## 31
          New Mexico
                        6
## 32
            New York
                        71
## 33 North Carolina
                        16
## 34
        North Dakota
                        1
## 35
                 Ohio
                        51
## 36
            Oklahoma
                        11
                         7
## 37
               Oregon
## 38
        Pennsylvania
                        70
## 39
        Rhode Island
                         2
## 40 South Carolina
                        15
## 41
        South Dakota
                         5
## 42
           Tennessee
                        22
## 43
                Texas
                        56
## 44
                 Utah
                         5
## 45
             Vermont
                         3
            Virginia
## 46
                        29
## 47
          Washington
                        17
## 48
       West Virginia
                        13
## 49
           Wisconsin
                        28
## 50
              Wyoming
                         1
```

```
ggplot(sor.df.2, aes(x=reorder(Var1, Freq), y=Freq)) + geom_bar(stat="identit
y", fill="gray") +
  coord_flip() +
  theme(axis.text.y=element_text(size=rel(0.8))) +
  xlab("Count") + ylab("State of Residence")
```

